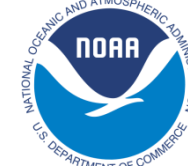




Atmospheric & Space Technology Research Associates LLC
www.astraspacenet



Ensemble Assimilation Using First-Principles Models: A Tool for Three-Day Space Weather Forecasts

Space Weather Workshop, 2015

April 16th, 2015

G. Crowley¹, M. Pilinski¹, J. Wolfe¹, T. Fuller-Rowell², T. Matsuo², S. Solomon³, L. Qian³,
J. Thayer⁴, M. Codrescu⁵

¹ASTRA LLC., ²CIRES. ³UCAR, ⁴U. of Colorado, ⁵NOAA

ASTRA: Space Weather Focus

❖ Science

❖ Technology

❖ Applications

Bringing It All Together



Modeling

**Data
Assimilation**

**Data
Services**

**Ground-based
Instrument
Development**

**Space
Systems**

**Physics-Based
Modeling
(TIMEGCM)**

**High-latitude
Electrodynamics**

**Space Based
Data**

**GPS-based Space
Weather Monitor**

CubeSat Missions

NSF: DICE & LAICE

AF: DIME, SIPS & TSS

**NASA: SORTIE &
MiRaTa**

**Real-Time
Specification
of
Ionosphere/
Thermosphere**

**Global
Ionosphere**

**Ground Based
Data**

**E-fields and
Magnetometers**

Plug-N-Play Avionics

**Thermospheric
Neutral Density**

**Forensic Space
Weather
Analysis**

**Low Power
Ionospheric
Sounder**

CubeSat Instruments

**Scanning
UV Photometer**

E-field Double Probe

RF Waves & Sounder

Wind Profiler

**GPS-based Space
Weather Monitor**

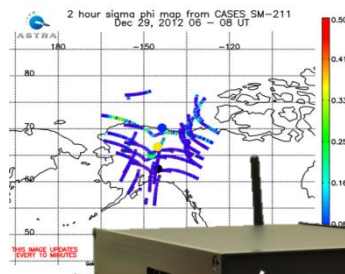
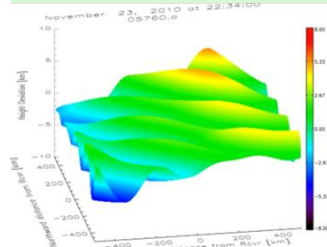
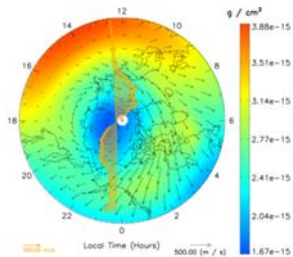
**Magnetometer &
Langmuir Probe**

**Satellite Drag &
Ballistic
Coefficients**

**Space weather
Phone Apps**

HF TID Mapper

Lidar Systems



Introduction

❖ Science

❖ Technology

❖ Applications

Bringing It All Together

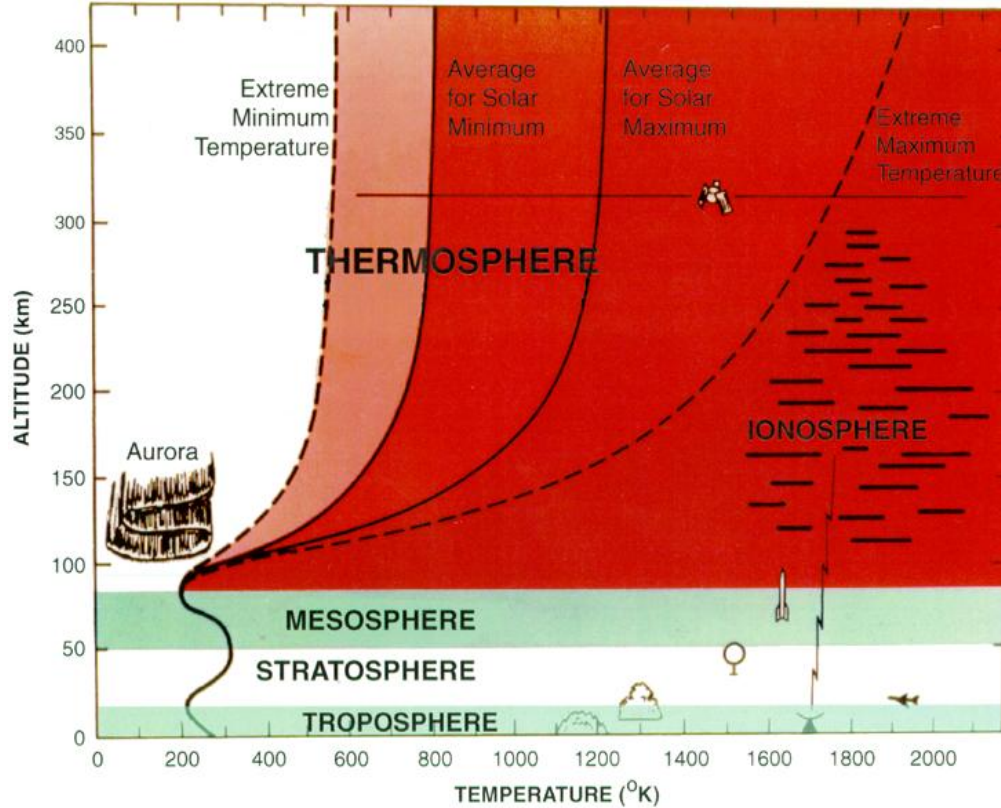
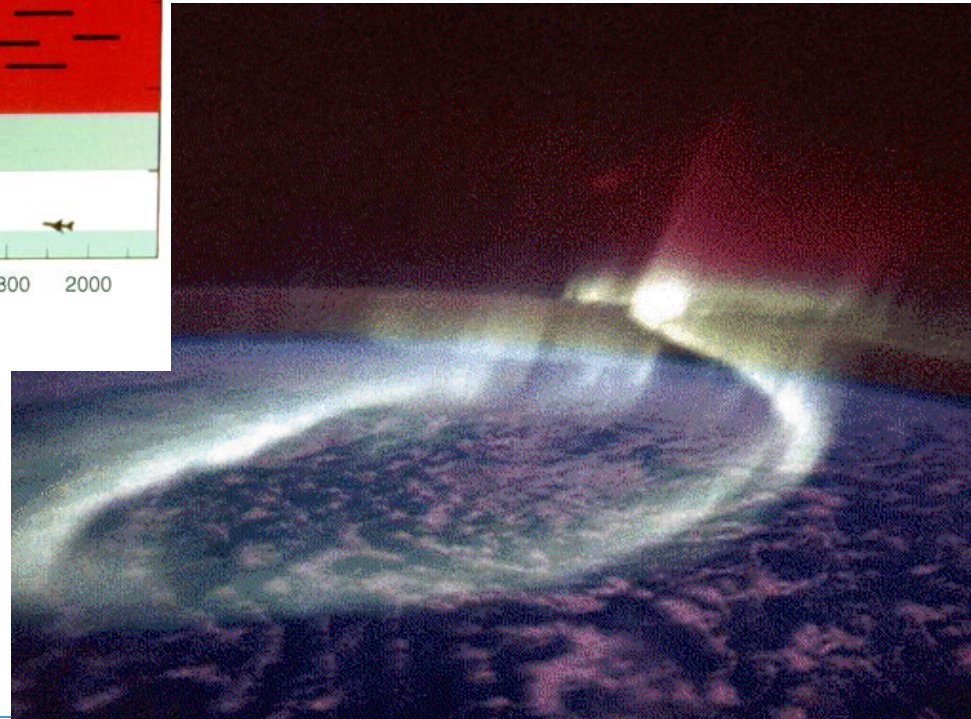


Figure 1c: Typical profiles of neutral atmospheric temperature





Introduction

- ❖ Science
- ❖ Technology
- ❖ Applications

Bringing It All Together

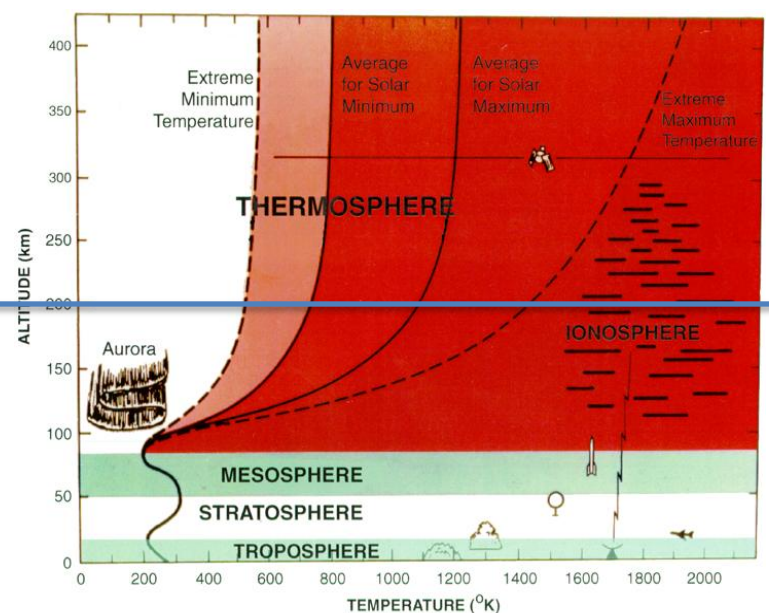
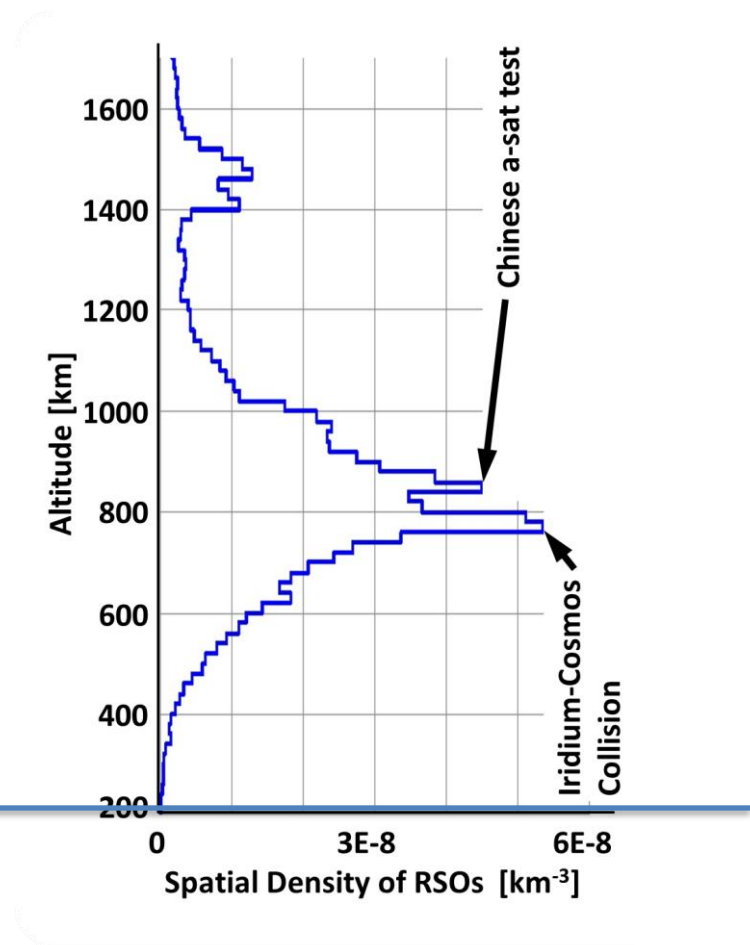


Figure 1c: Typical profiles of neutral atmospheric temperature



Who cares about satellite drag?

❖ Science

❖ Technology

❖ Applications

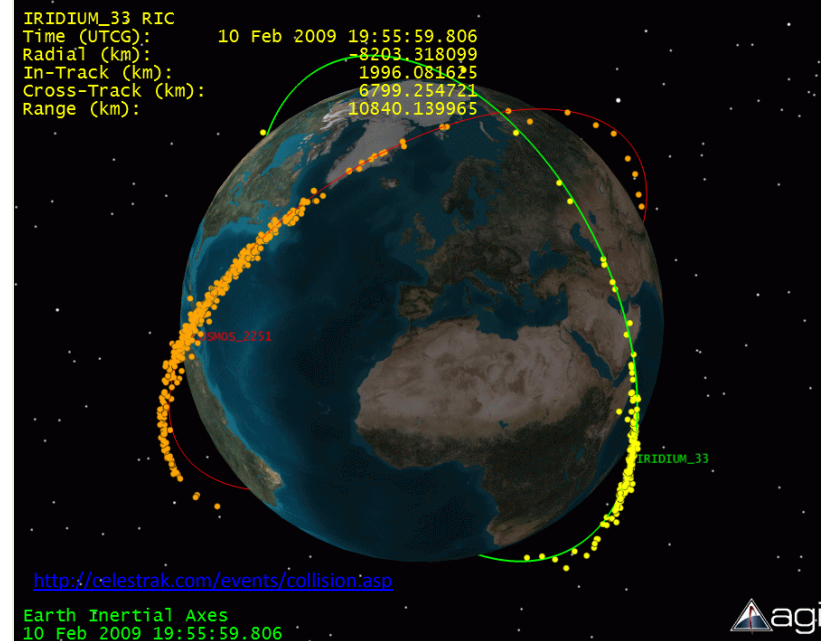
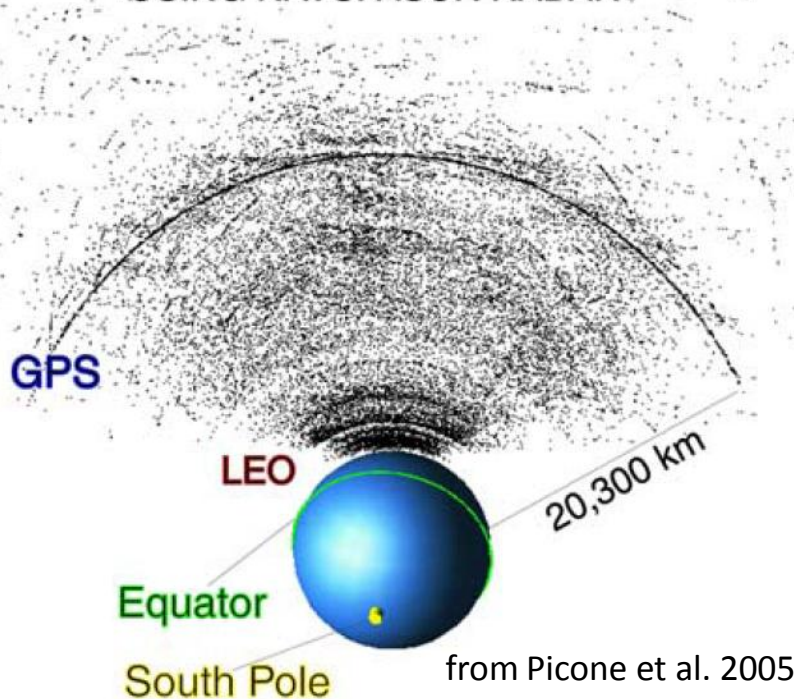
Bringing It All Together



Satellite drag errors degrade capability to:

- Maintain accurate catalog of all space objects
- Predict and avoid space collisions
- Predict satellite reentry time & location

RESIDENT SPACE OBJECT DETECTIONS USING NAVSPASUR RADAR



What is Satellite Drag?

❖ Science

❖ Technology

❖ Applications

Bringing It All Together

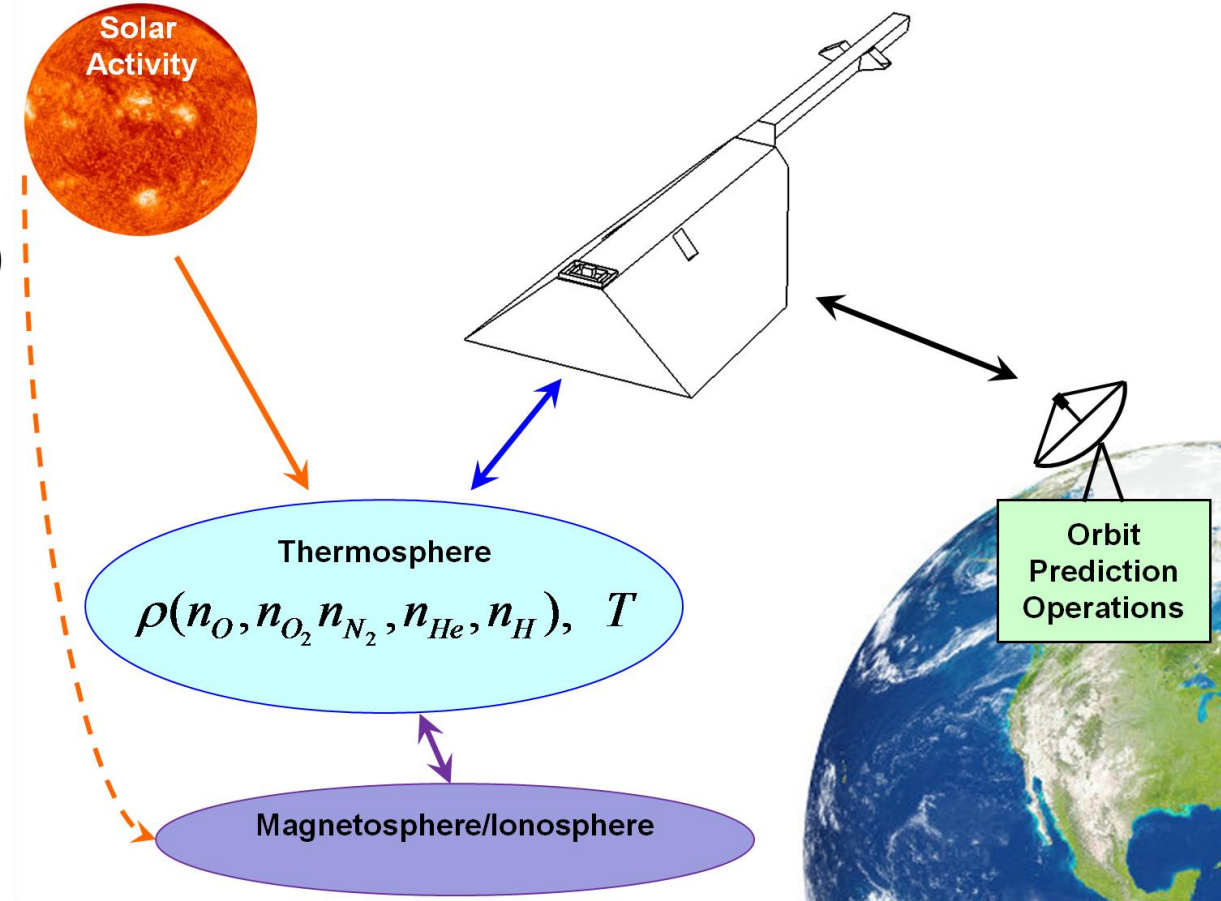


Direct Atmospheric Impacts

- Density = f(Temp, Composition)
- Winds

Indirect Atmospheric Impacts (through force coefficient)

- Composition
- Temperature
- Winds
- Mean-Free Path



$$a_D = -\frac{1}{2} \frac{C_D(T_a, V, \lambda, n_O, n_{N_2}, \dots, n_H) A}{m} \rho(T_a, n_{N_2}, \dots, n_H) V^2$$

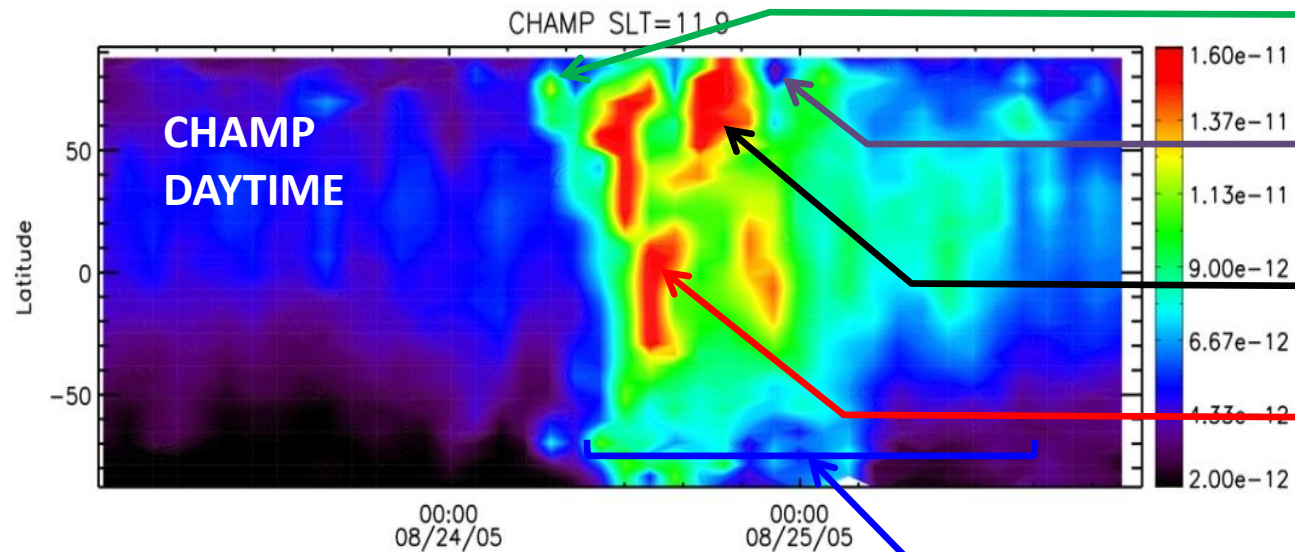
Density Perturbations at 400 km

❖ Science

❖ Technology

❖ Applications

Bringing It All Together

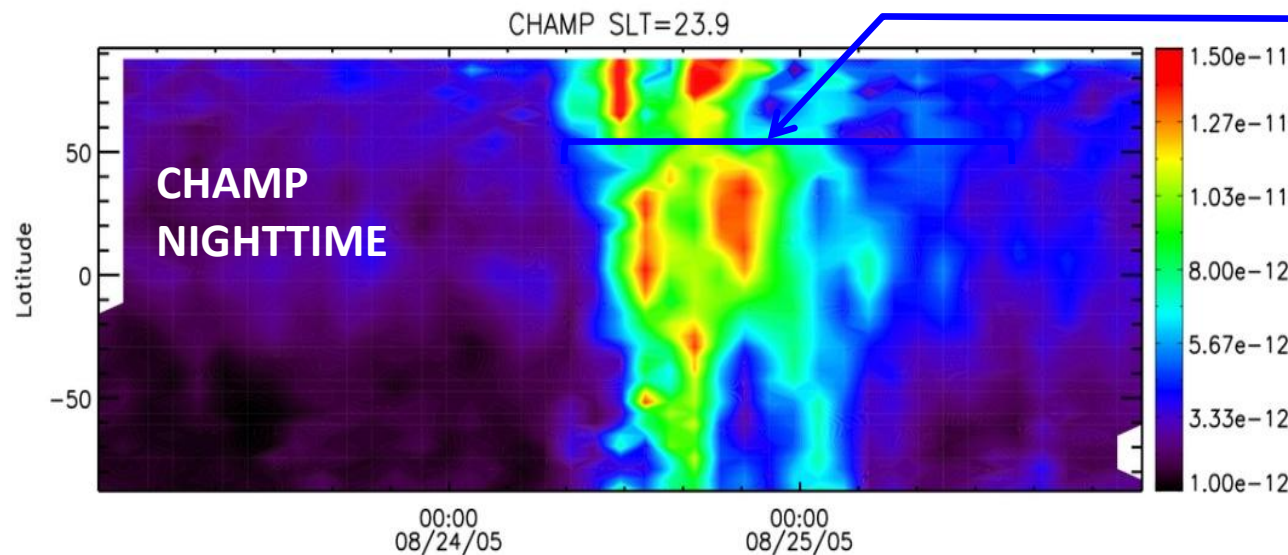


Cusp Density 0740 UT

**Density “hole”
20-24 UT**

**2nd Poynting Flux Event
16-20 UT**

**Gravity Wave
Propagation**



**Global Density
Enhancement lasting
many hours (orbits)**

ADAM Overview and Benefits

❖ Science

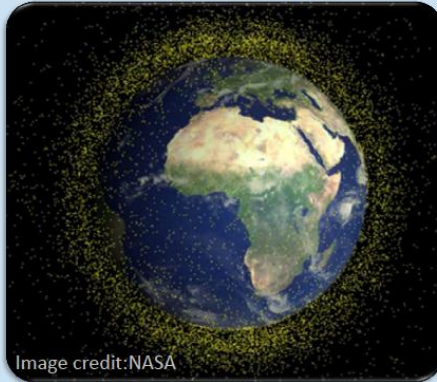
❖ Technology

❖ Applications

Bringing It All Together



Resident Space Objects (LEO)



satellite drag and density observations

- **Orbit observations**
- GPS
- Accelerometers
- O/N_2
- Mass Spectrometer

conjunction analysis

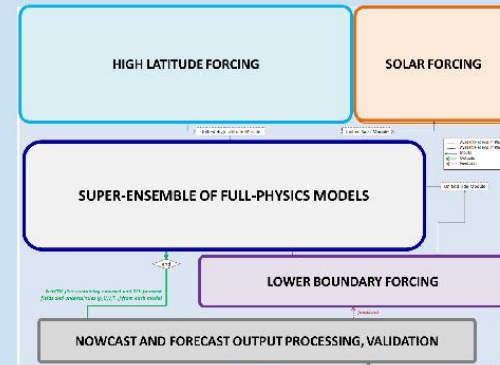
Results

- Improved satellite orbit nowcast and 72h forecast
 - Improvements over HASDM and JB08
 - Up to three-fold improvement during storms and solar minimum
- Densities, winds, and composition outputs
- Covers altitudes from 30 km to 1500 km
- Improved performance during geomagnetic storms

Atmospheric
Density
Assimilation
Model

Output information feeds into existing orbit prediction and determination tools

ADAM Architecture



orbital analysis

Super-Ensemble Approach

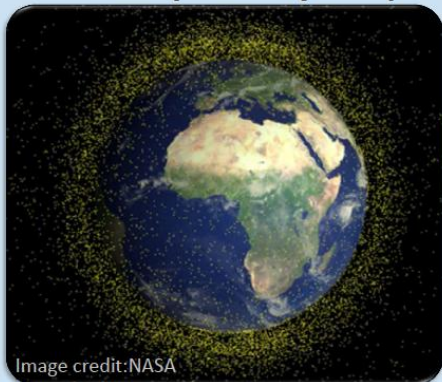




Requirements

	Requirement	Goal
Nowcast	Outperform JB08 <i>JB08: 7-18% at 200-800km</i>	Outperform HASDM (Jacchia '70, with 60-90 objects) <i>HASDM: 6-10% at 200-800km</i>
72h Forecast	Outperform JB08 in forecast mode	Outperform HASDM in forecast mode

Resident Space Objects (LEO)



satellite drag and density observations

- Orbit observations
- GPS
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- O/N₂
- Mass Spectrometer

conjunction analysis

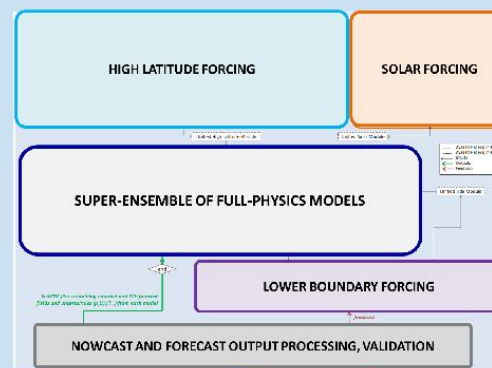
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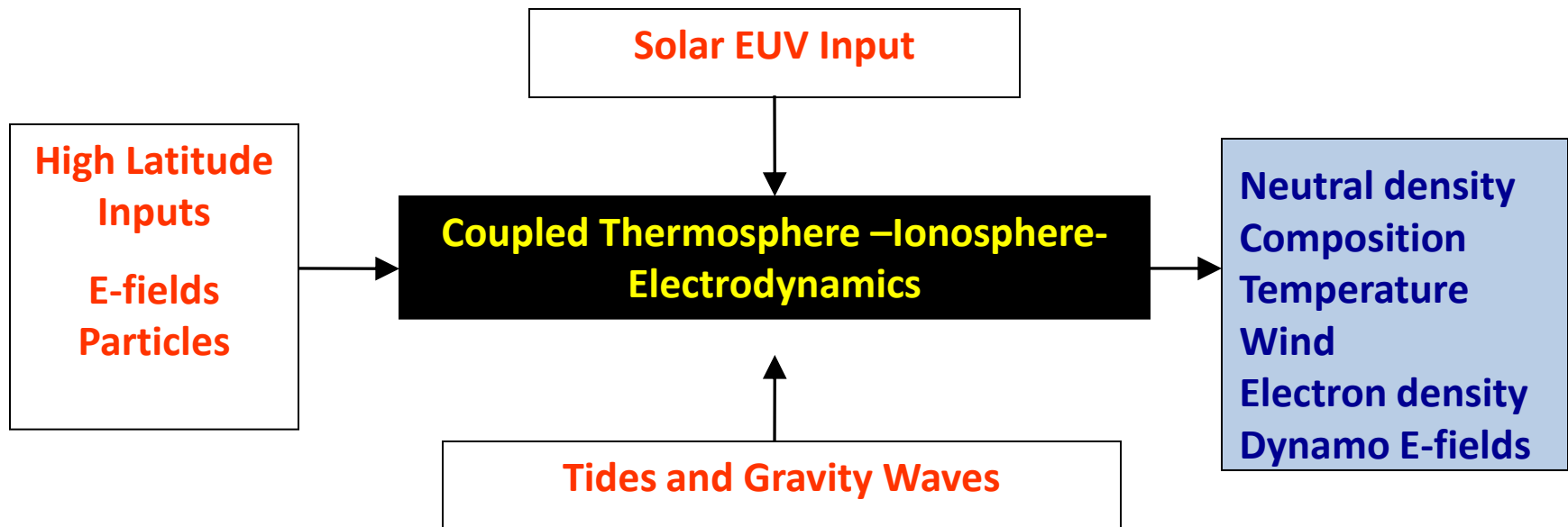
orbital analysis

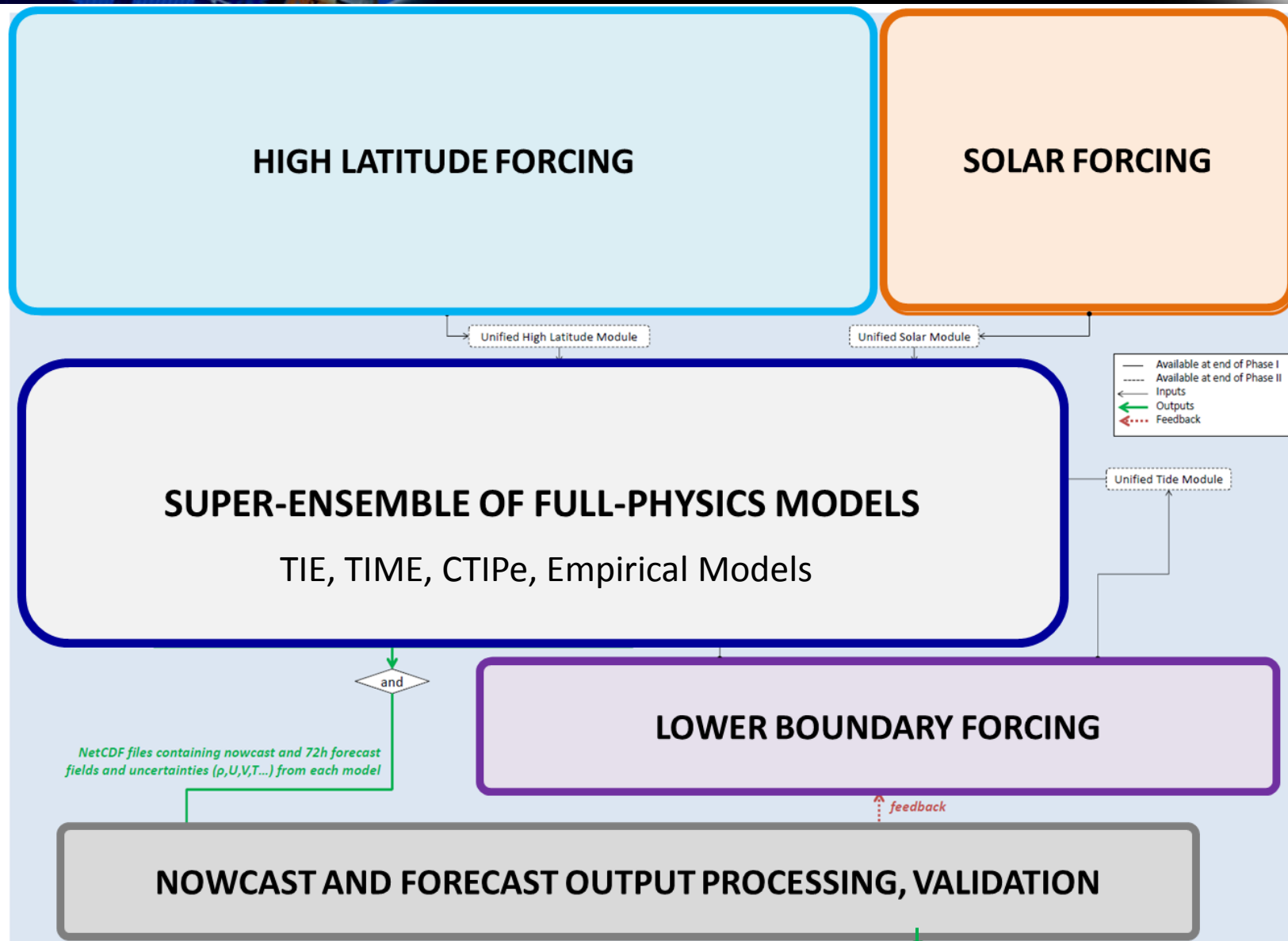
Super-Ensemble Approach

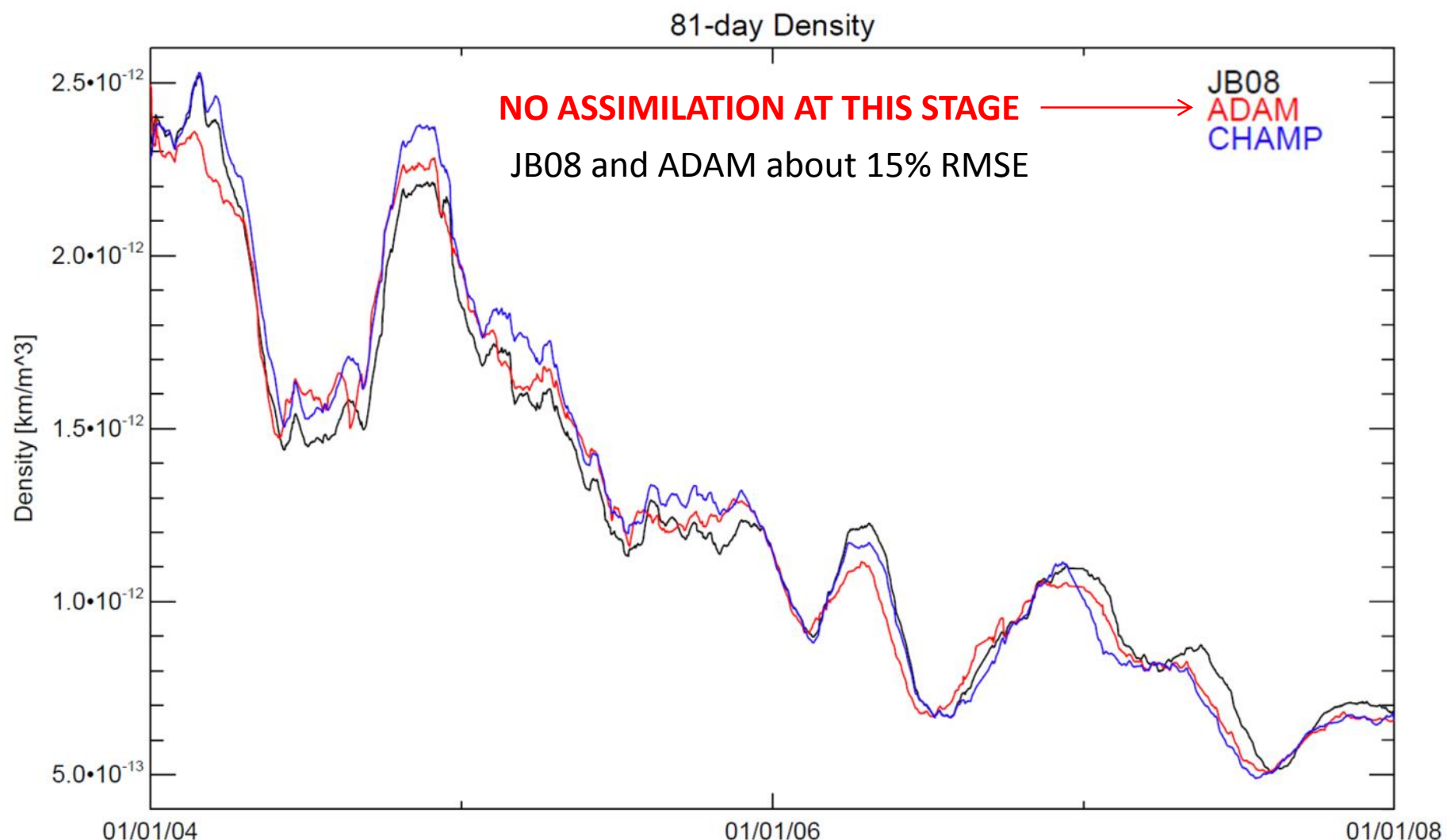


Image credit: TerraMetrics, Google

Important Inputs to the Thermosphere – Ionosphere System

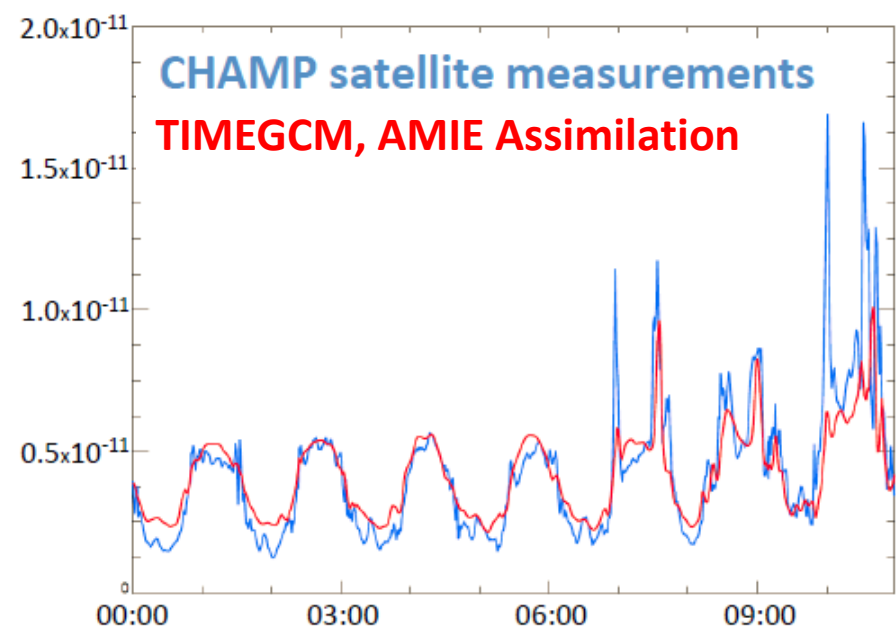
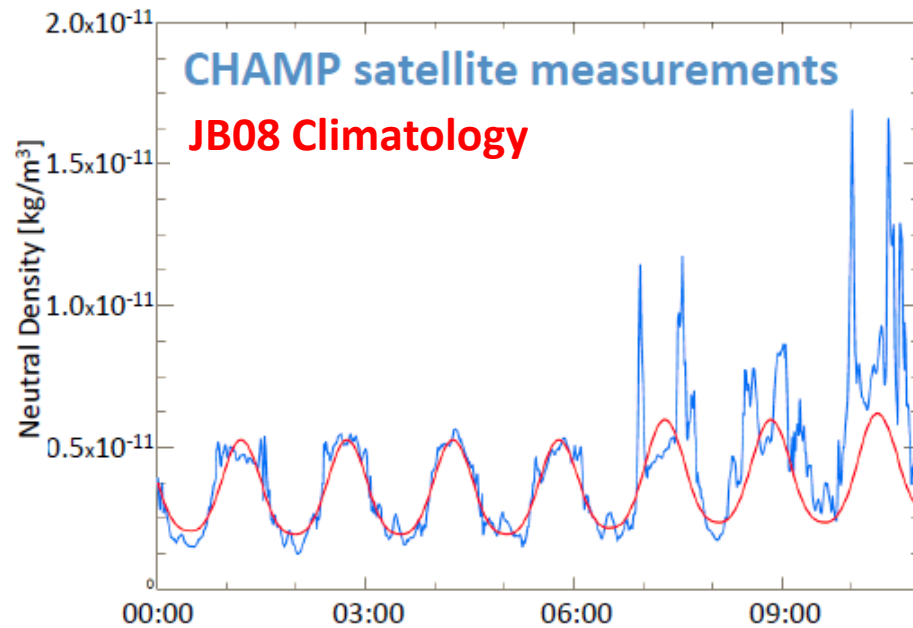






JB08 and CHAMP densities compared with best performing model in super-ensemble of full-physics members (based on 40-day trailing average)

Feasibility: storm response modeling



Improvements in neutral density when high-latitude electric fields are specified using assimilated electric fields



- Multiple model (super-ensemble) approach
- Dynamically tuned models result in optimum background atmospheric state
- Data Assimilation
- Graceful degradation in case of input-stream or model interruption
- Inclusion of TIME-GCM allows for specification of densities in the re-entry regime, down to 30km
- Inclusion of Helium in several models allows for drag computation up to 1500km

Architecture for Realtime Ensemble Runs

❖ Science

❖ Technology

❖ Applications

Bringing It All Together

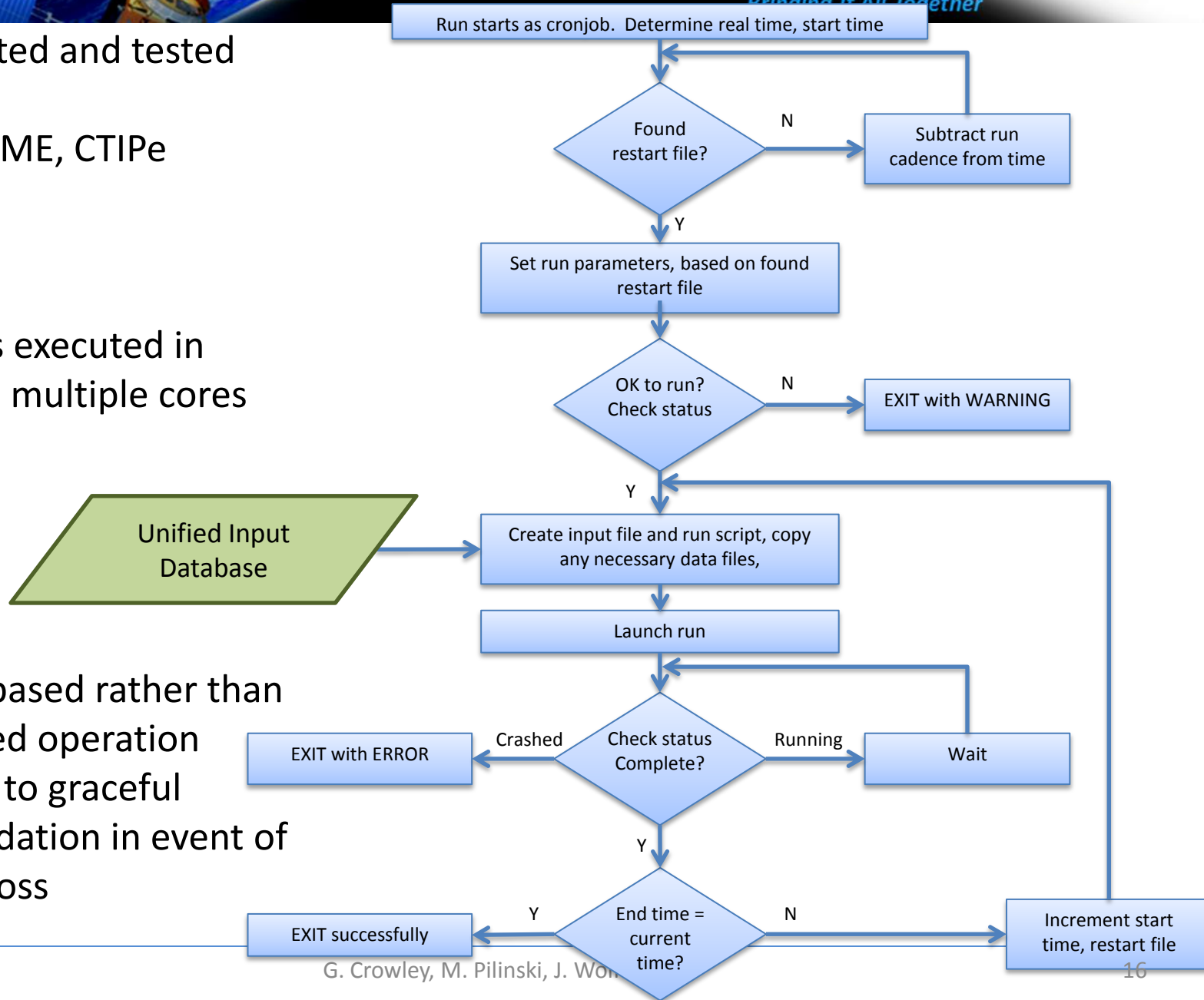


- Implemented and tested with:

- TIE, TIME, CTIPe

- Ensembles executed in parallel on multiple cores

- Schedule based rather than event based operation
 - Leads to graceful degradation in event of data-loss



Assimilation

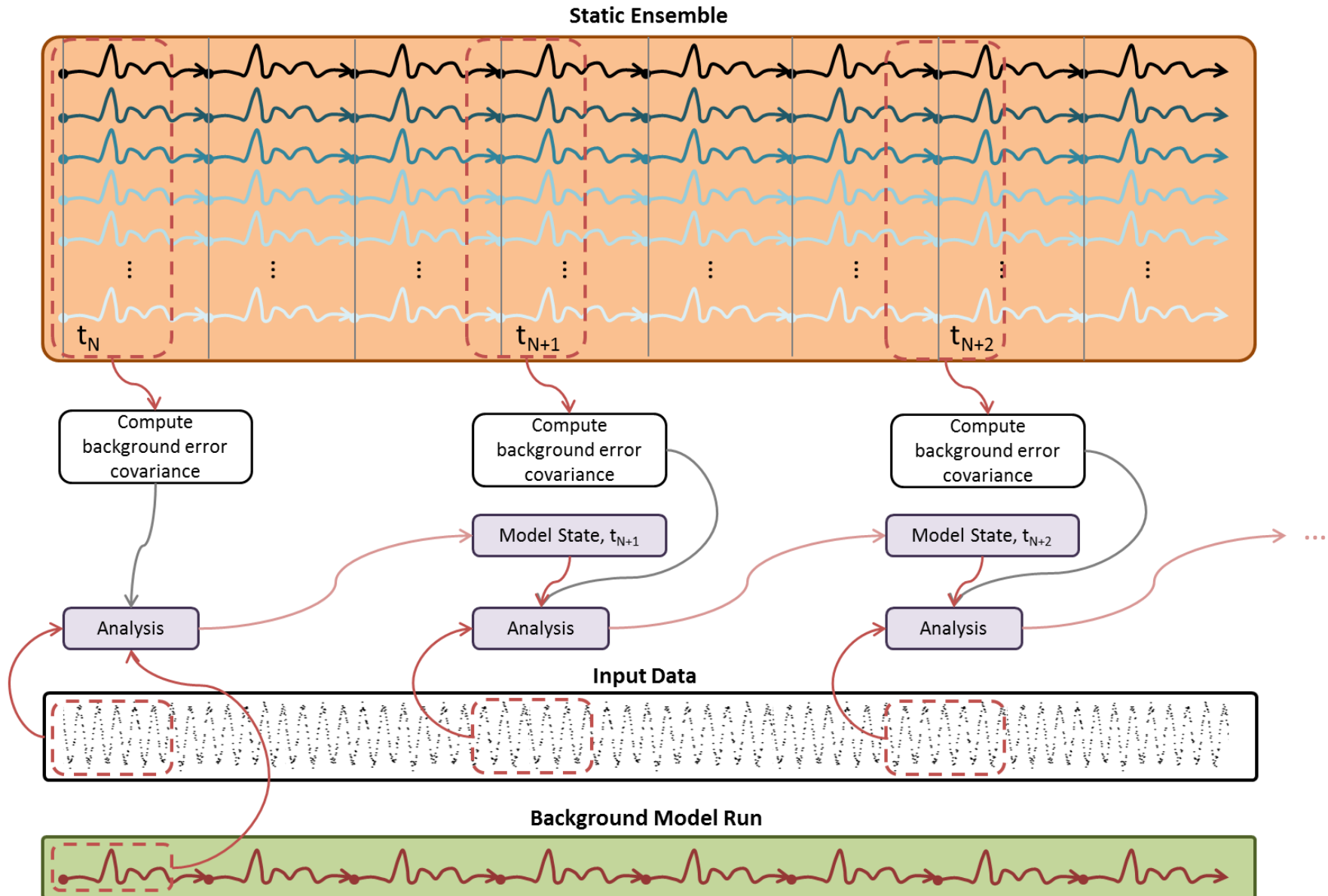
Optimal Interpolation (OI)

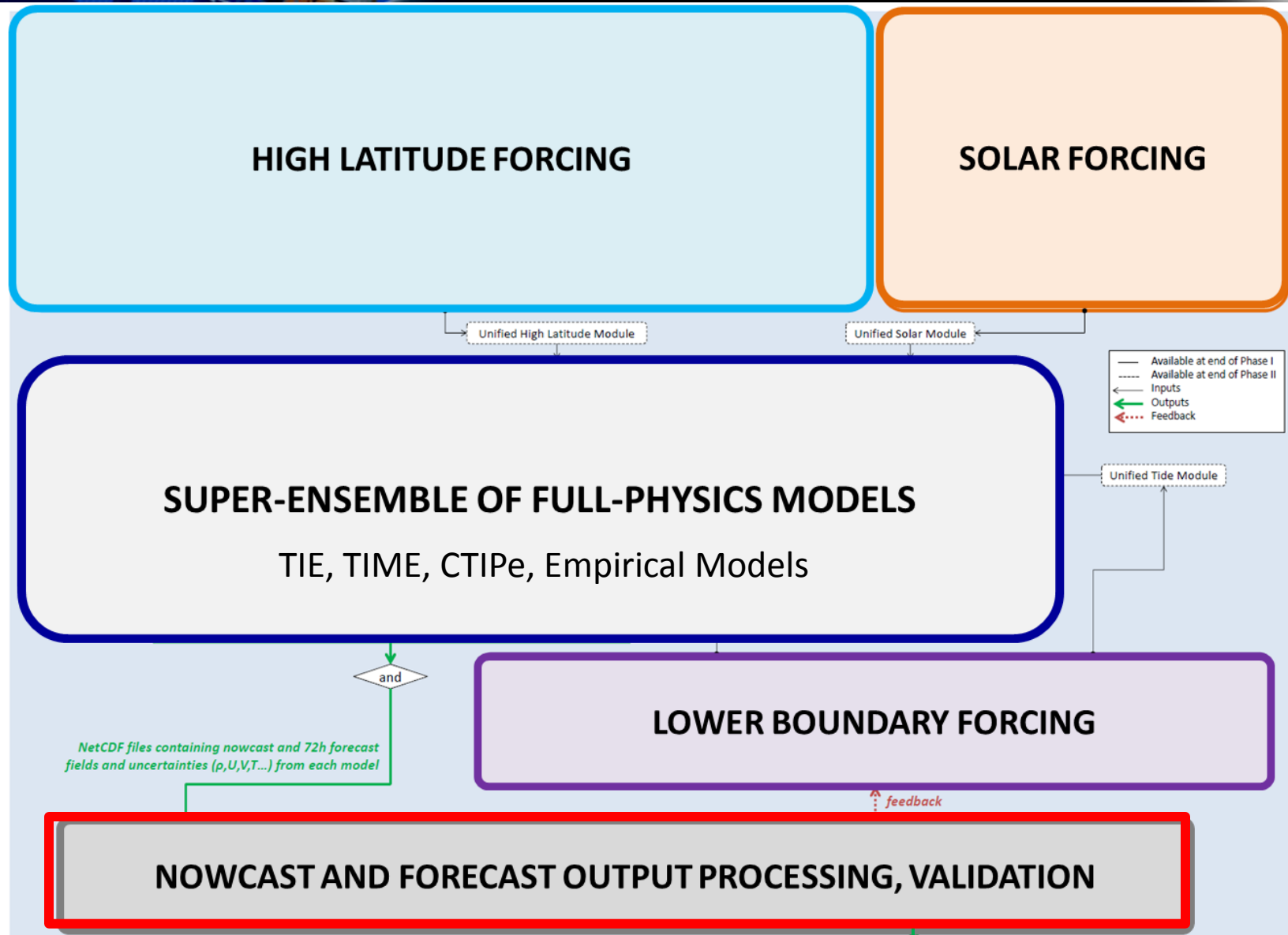
❖ Science

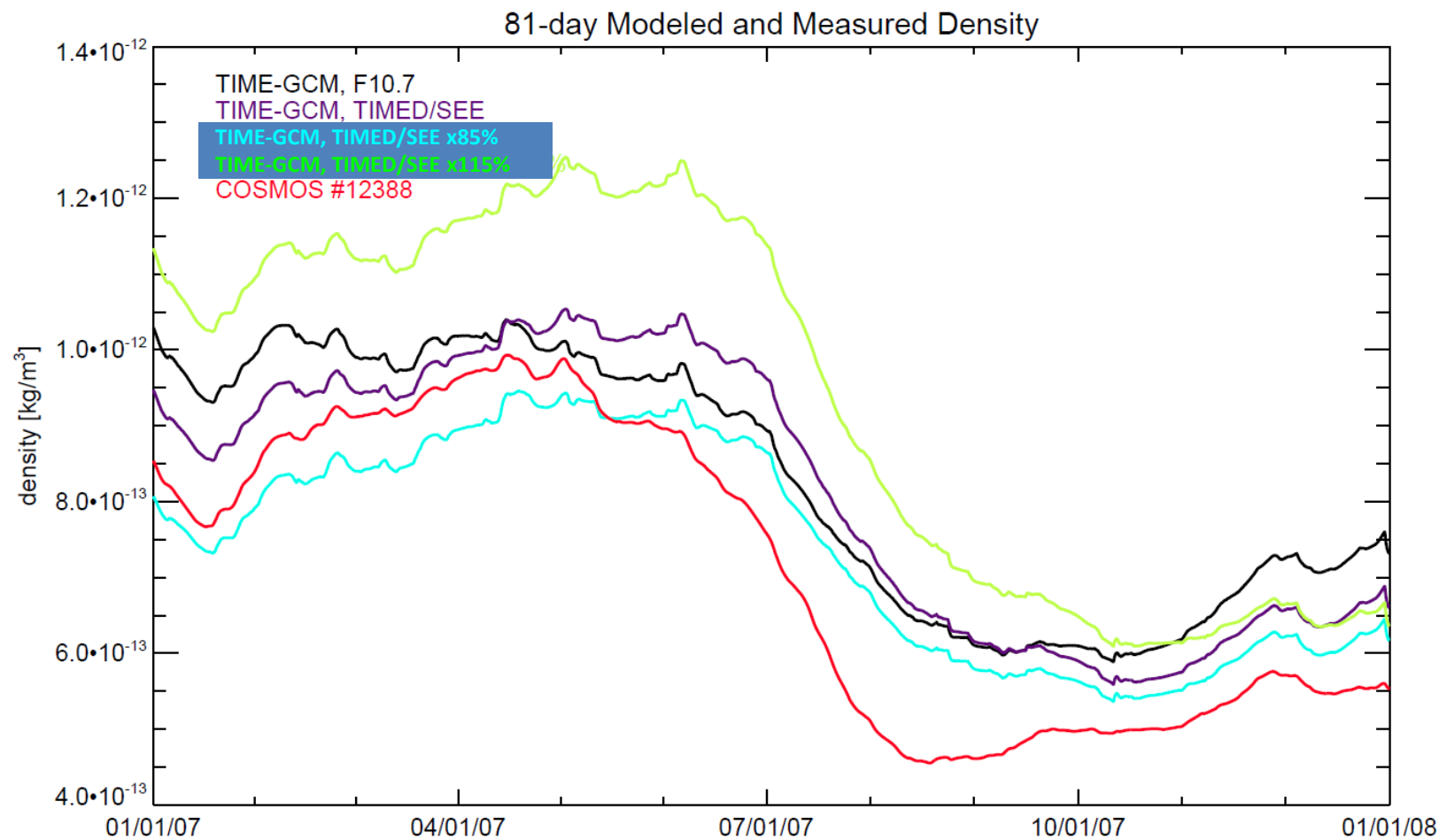
❖ Technology

❖ Applications

Bringing It All Together

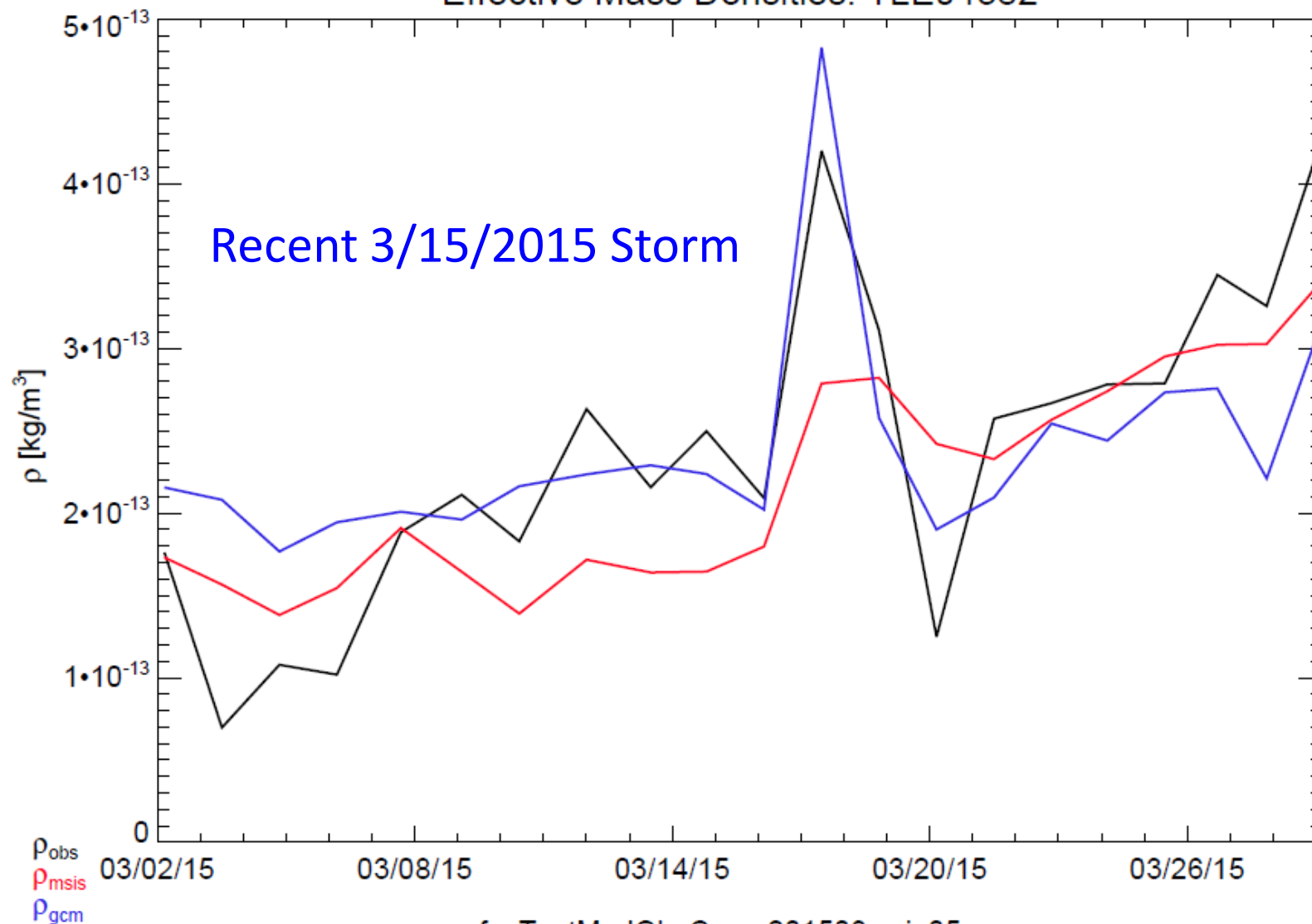






- TLE's are being used as a stand in for orbital arcs analysis
 - Cadence and arc length is a conservative stand-in for the special-perturbations approach available operationally to the customer
 - Will transition to 6-hour arcs from special perturbations analysis in Phase III
- Temporary Drawbacks
 - Lower signal-to-noise
 - Latency (~1 day)

Effective Mass Densities: TLE04382



fcnTestModObsComp201503_win05.ps

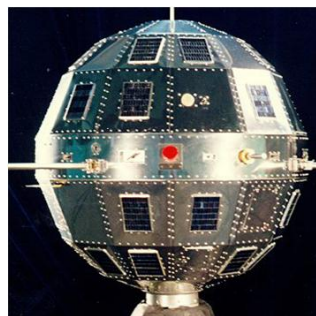
Assimilated Data Types

Data Type	Assimilation Time Span	Notes
Orbit Average Drag i.e. Calspheres, DANDE, POPACS	6-72 h	Infer observed energy dissipation rate (EDR) from general perturbations (TLEs) or special perturbations (high task tracking data). Select 30-90 objects with stable ballistic coefficients.
Orbit Average Densities	24 hours	Already processed high-task tracking data
Orbit Resolved Drag: GPS	15-30 min	Observed EDR from special perturbations and GPS measurements
Orbit Resolved Drag: accelerometers (Swarm)	15 min	Observed acceleration at 10-45 sec cadence (in-track and cross-track), binned to 15 min
O/N2 (GOLD, DMSP-SSUSI)	30 min	Dayside disk composition
Mass Spectrometer	10-30 sec	In-situ day and night composition

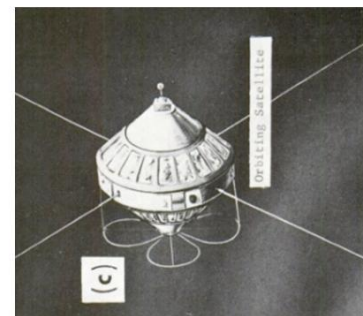
Dynamic Calibration from Observations of Satellite Orbits



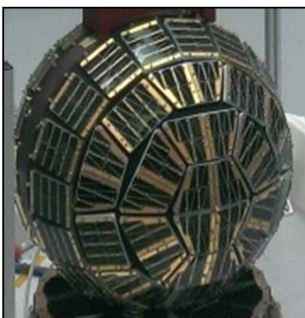
VANGUARD II



DFH-I



EXPLORER VII



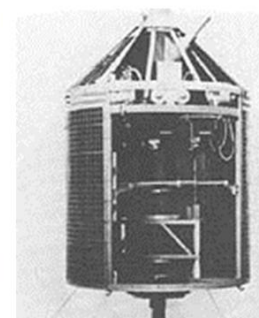
DANDE



POPACS 1, 2, 3



RIGIDSPHERE 2



AZUR (GRS A)



PAM-D (left), SL-3 (center), SL-8 (right) rocket body outlines, shown to scale

190 – 900 km altitude, $\pm 90^\circ$ latitude coverage

- New state-of-the-art assimilative model of the thermosphere is being developed
- Include many of the lessons learned from NADIR MURI project (funded by AFOSR)
- 1st year into a 2-yr project
- Expected to meet AF goals and requirements for specifying satellite drag
- Future plans to make outputs commercially available to civilian customers



Thank You!

We appreciate your questions and feedback

What is Satellite Drag?

Relative importance of various scales

❖ Science

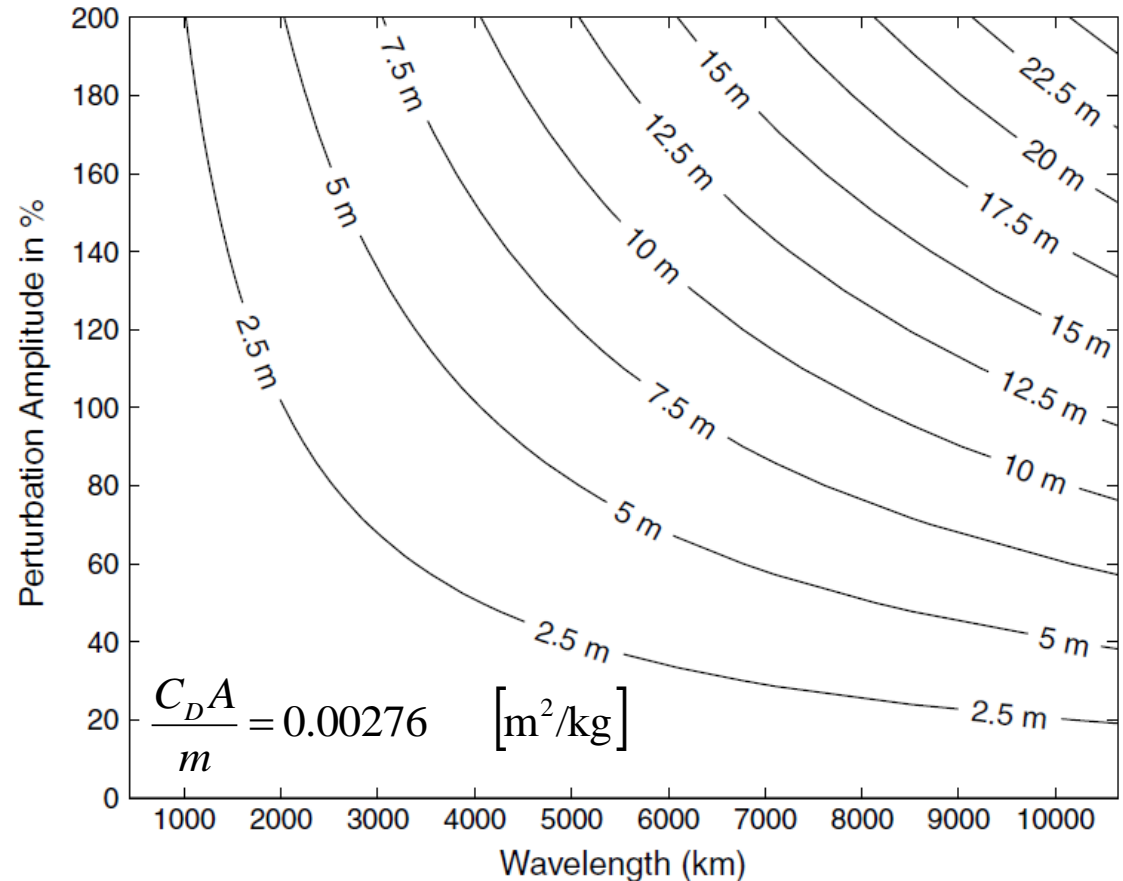
❖ Technology

❖ Applications

Bringing It All Together



24 Hour Orbital In-Track Error at 400km Circular Orbit



[Anderson et al. 2009]

- Large scale perturbations can be misrepresented in empirical models
- It takes long-wavelength perturbations to cause significant position errors
- 3U sun-pointing CubeSat
 $\frac{C_D A}{m} \approx 0.02 \text{ [m}^2/\text{kg]}$
- 100m errors are considered “significant” by USAF at 400 km altitude [Anderson et al. 2008]

What is Satellite Drag?

Relative importance of various scales

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❖ Technology

❖ Applications

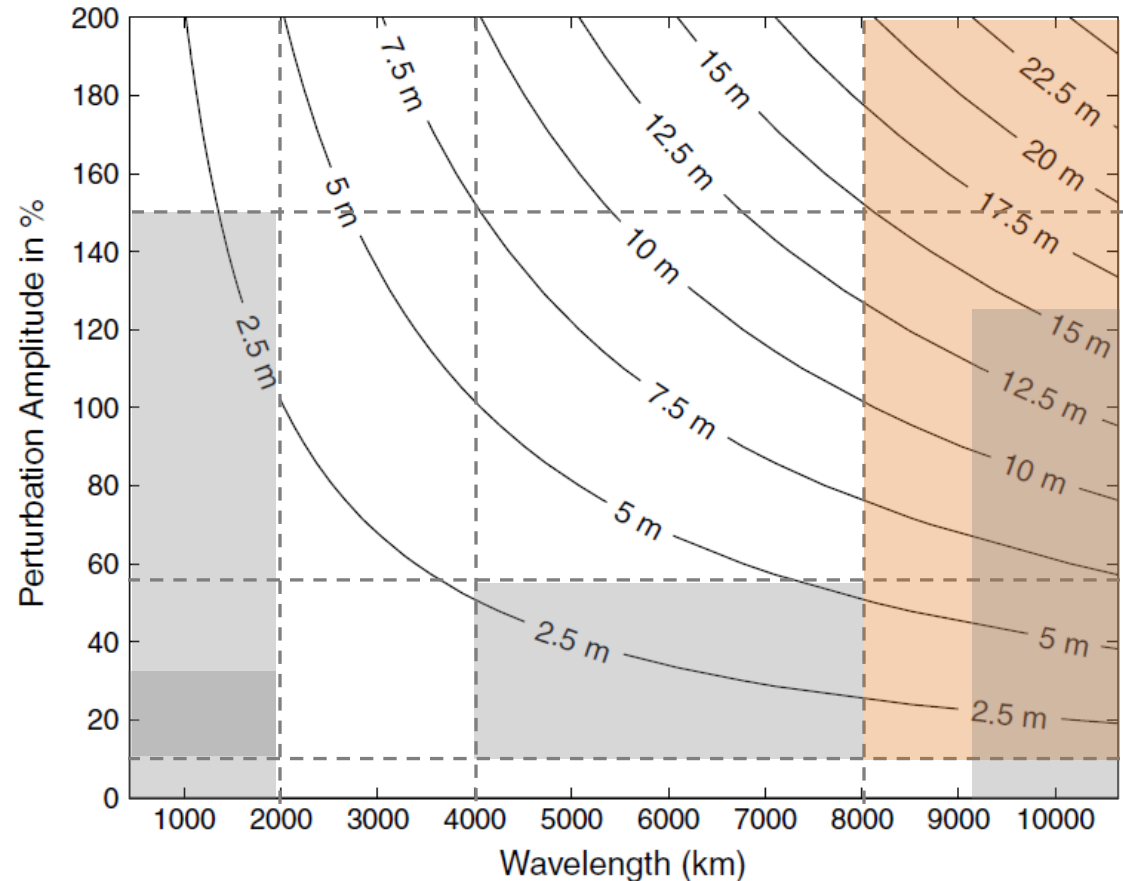
Bringing It All Together



What physical processes are important?

- Large scale storm structures
- Seasonal variability
- Density cell
- Cusp enhancement
- Non-hydrostatic effects

24 Hour Orbital In-Track Error at 400km
Circular Orbit



[Anderson et al. 2009]

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Relative importance of various scales

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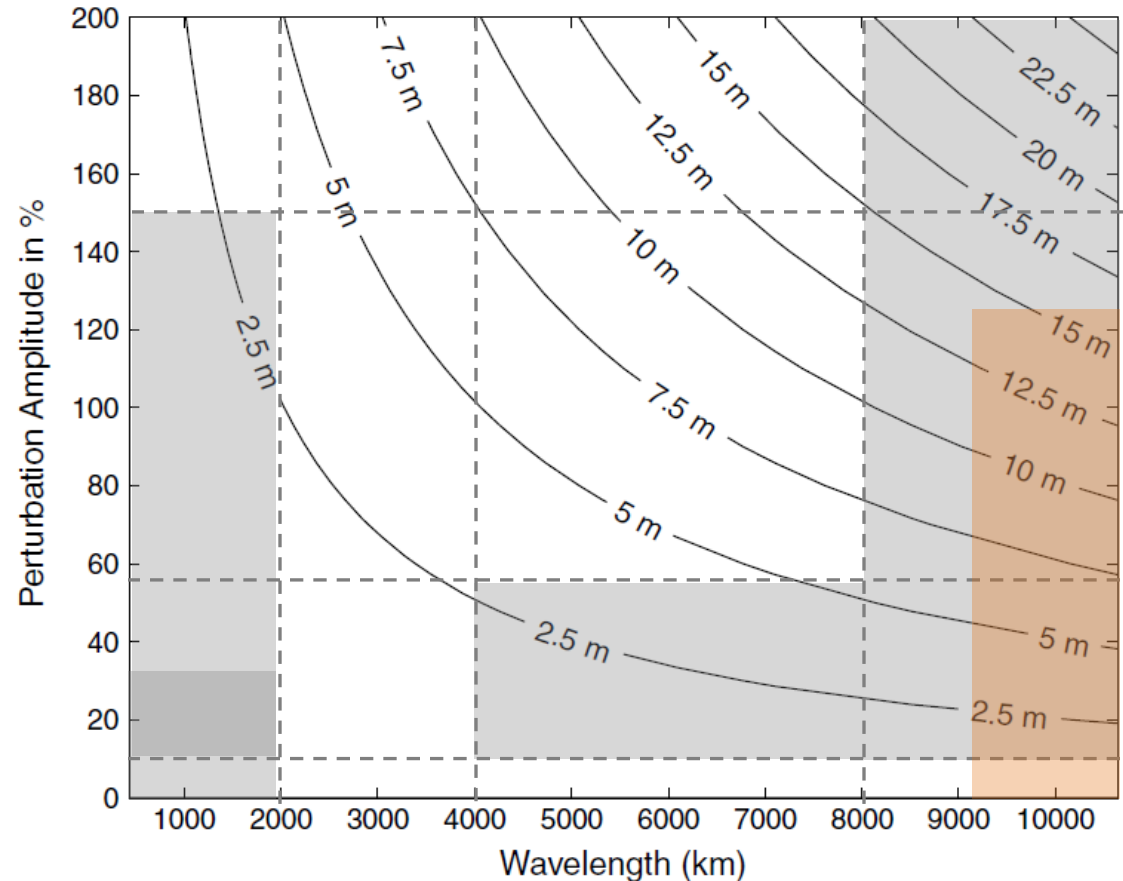
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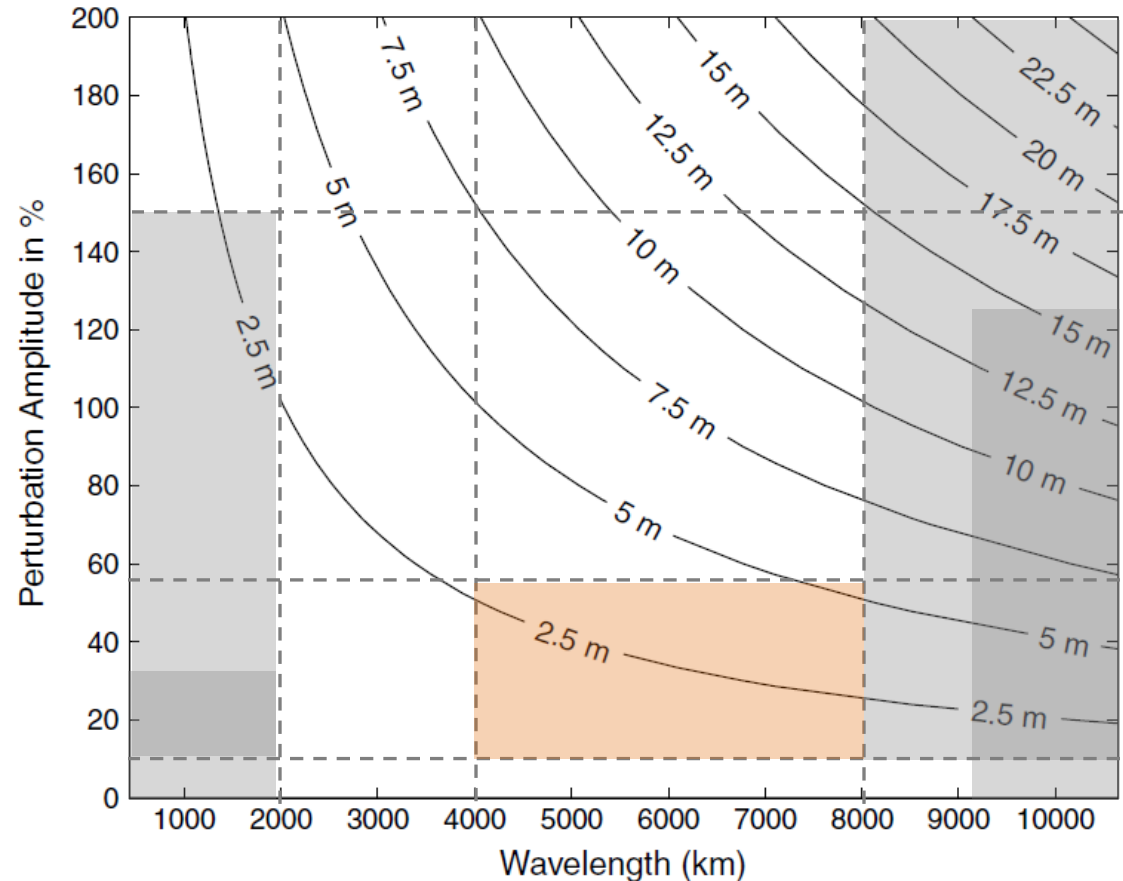
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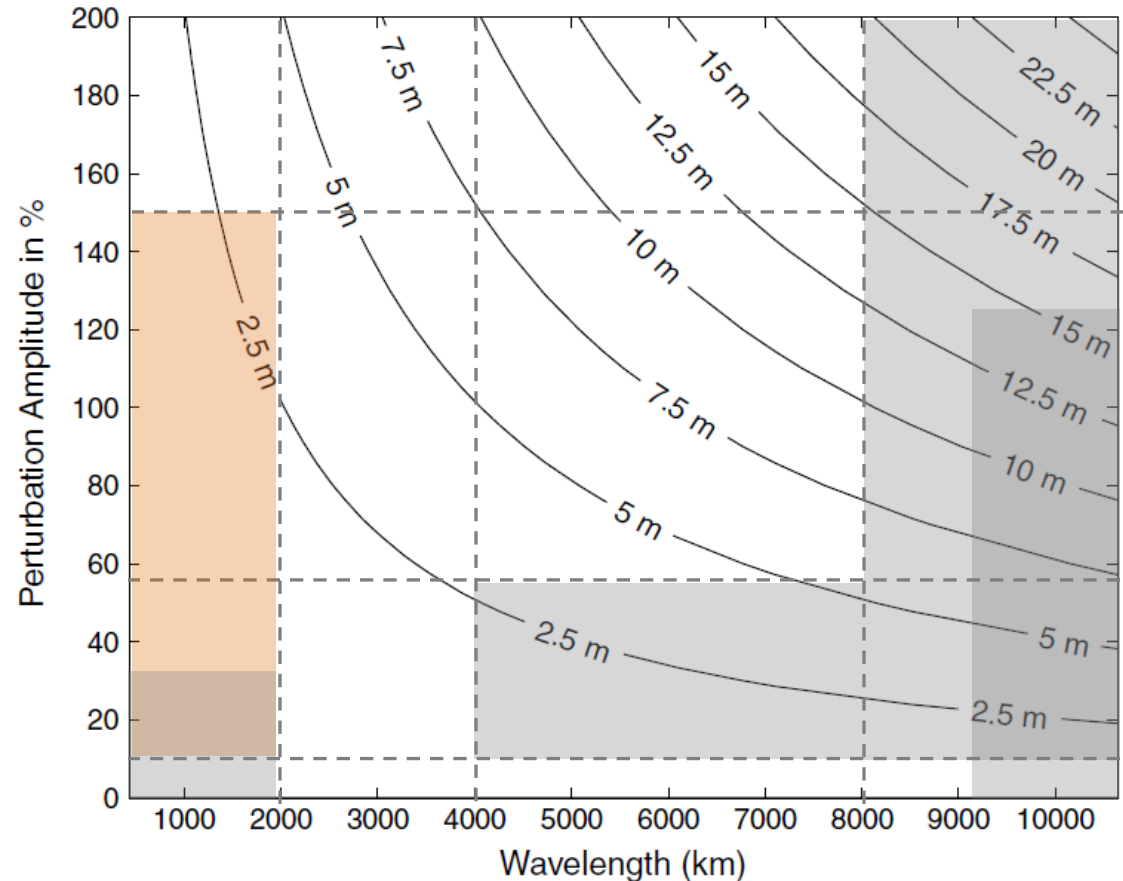
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[Anderson et al. 2009]

*not a persistent feature on these time scales

What is Satellite Drag?

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❖ Technology

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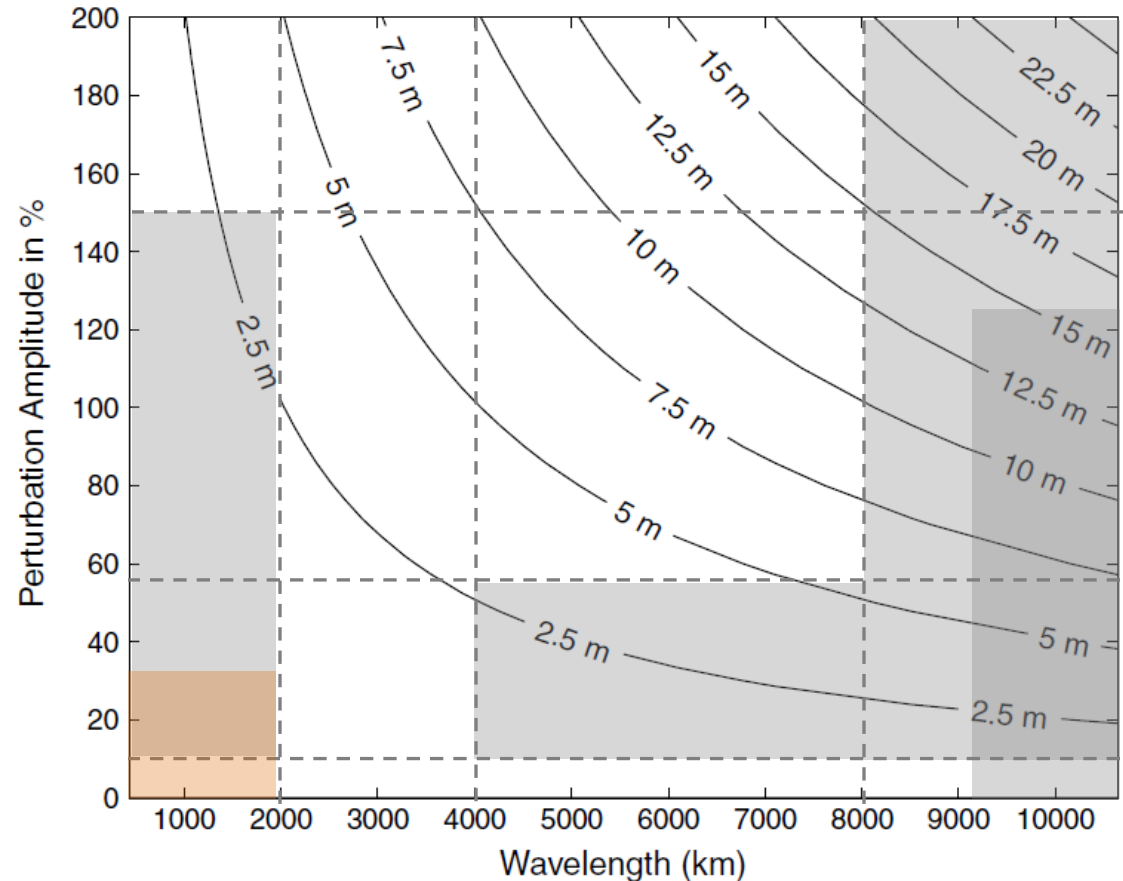
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